

Hardware-Focused Connected and Automated Vehicle (CAV) Research: Experimental Results and Benefit Analysis

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Center for Transportation Research, Argonne National Laboratory

DOE Annual Merit Review
June 20th, 2018

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OVERVIEW

Timeline

Revised focus on EEMS for FY18

- Project start date: 10/2017
- Project end date: 9/2018
- Percent complete: ~75%

Budget

- FY17 Funds - \$2,000k
Previous focus on vehicle technology evaluation
- **FY18 Funds – \$1,000k**
100% DOE Funds

Highlighted Barriers

- Difficulty in sourcing accurate and traceable real-world data
- Rapid evolution of CAV technologies
- Constant advances in technology drive unexpected consequences for CAVs

Partners

- Argonne and DOE Vehicle Modeling & Controls PIs
- DOE-SMART consortium researchers
- Illinois Institute of Technology
- HPC-Big Data researchers

RELEVANCE - Fundamental Disruption is Occurring in Transportation

DOE Energy Efficient Mobility System (EEMS) Strategic Goals

STRATEGIC GOAL #1

Develop new tools, techniques, & core capabilities to understand & identify the most important levers to improve the energy productivity of future integrated mobility systems.

STRATEGIC GOAL #2

Identify & support early stage R&D to develop innovative technologies that enable energy efficient future mobility systems.

STRATEGIC GOAL #3

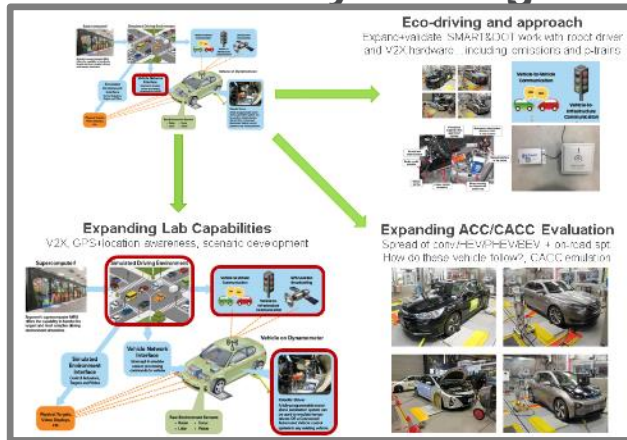
Share research insights, and coordinate and collaborate with stakeholders to support energy efficient local and regional transportation systems.

Supporting DOE's research within the expanded context of vehicle connectivity and automation

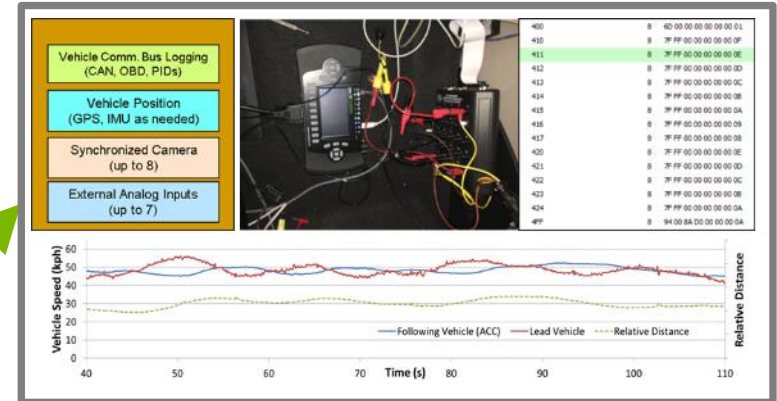
- Building upon existing experimental expertise & best-practices
- Providing tractable and robust laboratory data (when applicable)
- Overlaying state-of-the-art vehicle technologies in a CAV context
- Expanding what is possible within an experimental context

APPROACH – FOUR OVERLAPPING RESEARCH THRUSTS

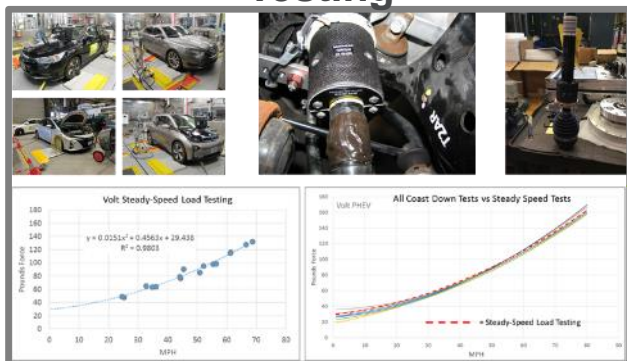
Laboratory Testing



Collect Realistic, On-road Behavior

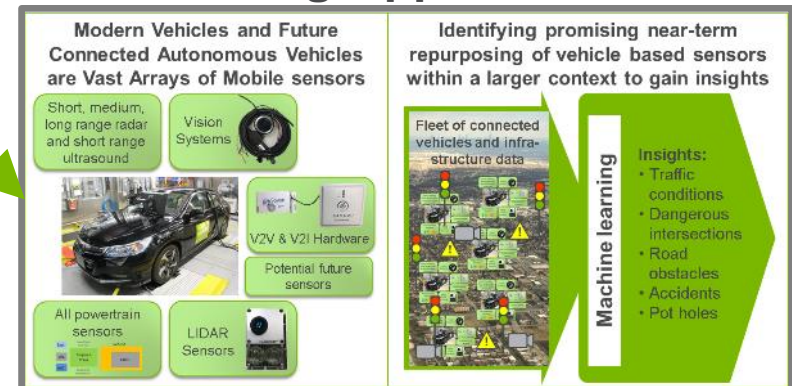


Targeted On-Road & Track Testing



Hardware Focused Research

CAVs Enabled Awareness and Sensing Opportunities



APPROACH

High-fidelity data regardless of environment:

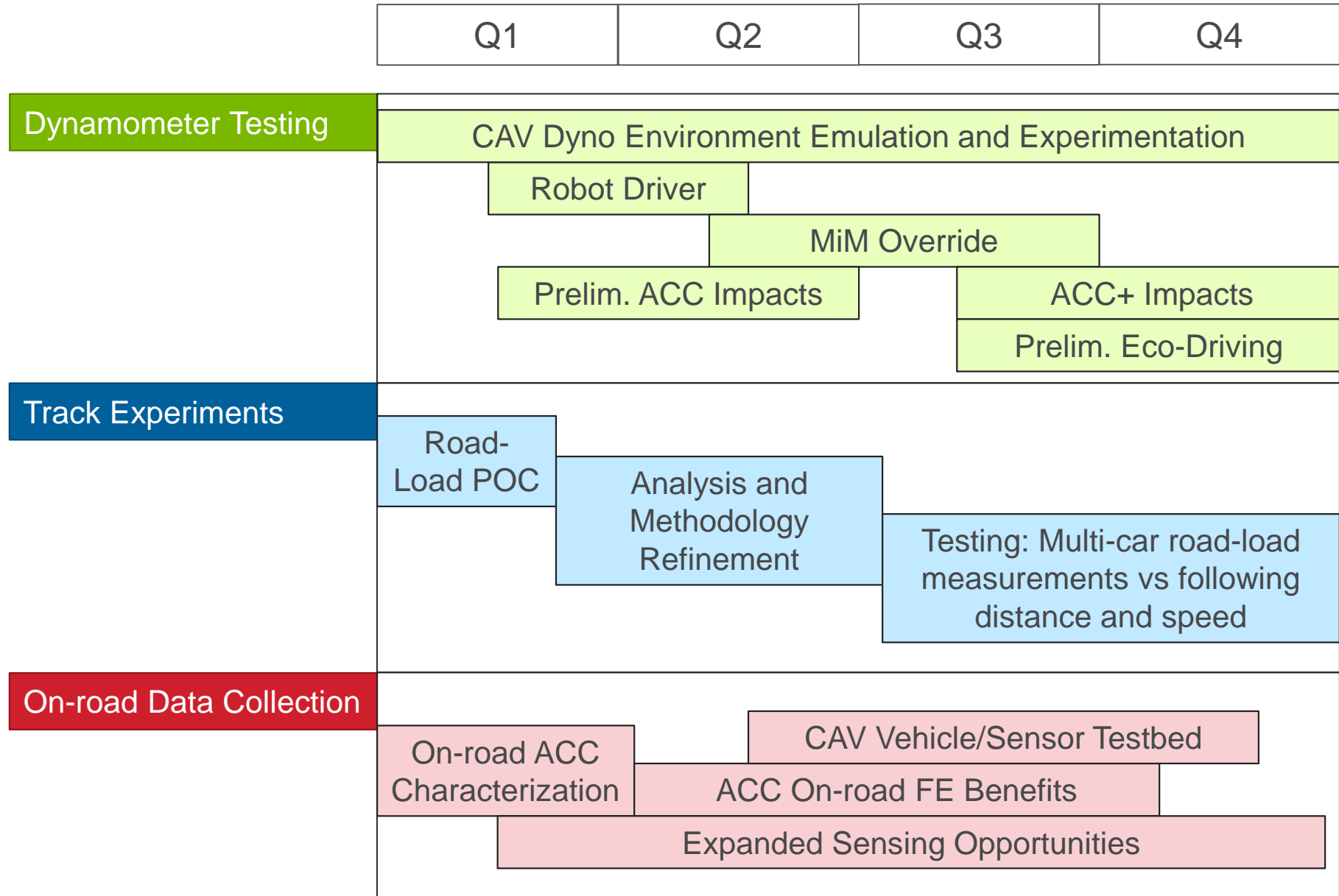
- Vehicle-based messages from CAN/diagnostics
- Decoded messages for ACC/related systems
- Cameras (up to 8 time sync'd)
- Direct axle torque measurement
- GPS data @ 5Hz (std.) to 20Hz (supplemental hardware)
- Direct in-line fuel measurement
- Man-in-the-middle capability for further experimentation



Filter	Count	Time	To	From	Description	Unit/Value	Len	Category
0	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 800	100	8	00:00:00.000 00:00:00.000
1	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 801	100	8	00:00:00.000 00:00:00.000
2	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 802	100	8	00:00:00.000 00:00:00.000
3	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 803	100	8	00:00:00.000 00:00:00.000
4	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 804	100	8	00:00:00.000 00:00:00.000
5	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 805	100	8	00:00:00.000 00:00:00.000
6	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 806	100	8	00:00:00.000 00:00:00.000
7	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 807	100	8	00:00:00.000 00:00:00.000
8	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 808	100	8	00:00:00.000 00:00:00.000
9	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 809	100	8	00:00:00.000 00:00:00.000
10	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 810	100	8	00:00:00.000 00:00:00.000
11	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 811	100	8	00:00:00.000 00:00:00.000
12	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 812	100	8	00:00:00.000 00:00:00.000
13	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 813	100	8	00:00:00.000 00:00:00.000
14	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 814	100	8	00:00:00.000 00:00:00.000
15	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 815	100	8	00:00:00.000 00:00:00.000
16	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 816	100	8	00:00:00.000 00:00:00.000
17	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 817	100	8	00:00:00.000 00:00:00.000
18	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 818	100	8	00:00:00.000 00:00:00.000
19	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 819	100	8	00:00:00.000 00:00:00.000
20	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 820	100	8	00:00:00.000 00:00:00.000
21	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 821	100	8	00:00:00.000 00:00:00.000
22	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 822	100	8	00:00:00.000 00:00:00.000
23	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 823	100	8	00:00:00.000 00:00:00.000
24	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 824	100	8	00:00:00.000 00:00:00.000
25	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 825	100	8	00:00:00.000 00:00:00.000
26	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 826	100	8	00:00:00.000 00:00:00.000
27	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 827	100	8	00:00:00.000 00:00:00.000
28	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 828	100	8	00:00:00.000 00:00:00.000
29	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 829	100	8	00:00:00.000 00:00:00.000
30	1	00:00:00.000	00:00:00.000	00:00:00.000	HS CAN0 830	100	8	00:00:00.000 00:00:00.000



FY18 MILESTONES AND PROJECT OVERVIEW

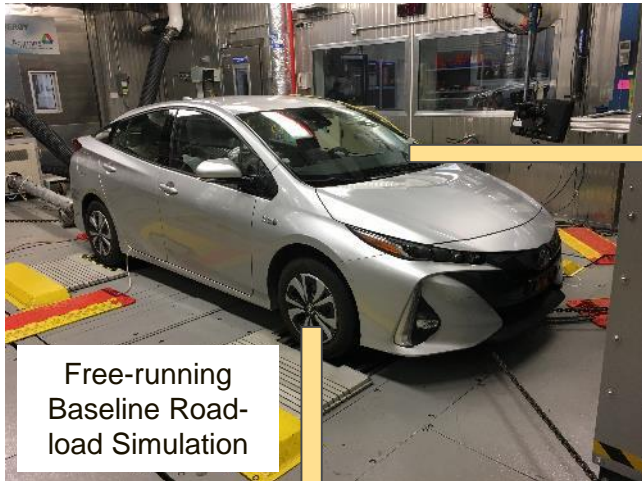


Accomplishments: Energy-Centric CAV Laboratory

Three broad categories of “energy-intelligent” behaviors

1) Location Awareness 2) V2X Communication and coordination 3) In-vehicle technologies

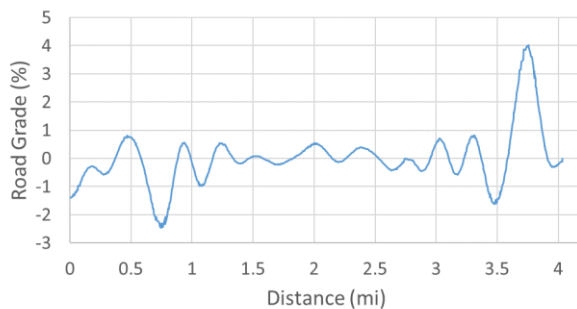
Emulated “Driver” and Controls



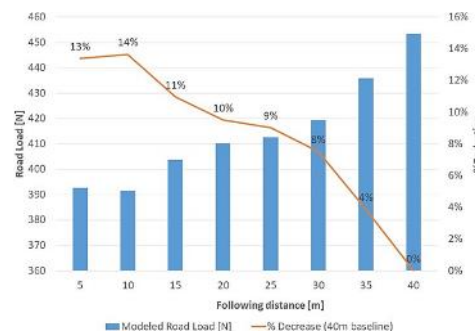
- 1) **Processed Cycles – human driver**
 - + Fast, historical crossover
 - Trace following versus “driving”
- 2) **Robot driver adapted for CAVs**
 - + Adaptable to non-CAVs vehicles
 - + Very repeatable control inputs
 - ? Subject to vehicle pedal mapping/dynamics
- 3) **Generalized Man-in-the-Middle**
 - + Override traction controls directly
 - + Override other controls (when possible)
 - + Intercept and modify specific signals (lead car)

Emulated “Tractive” Environment

Distance-based Road Profiles



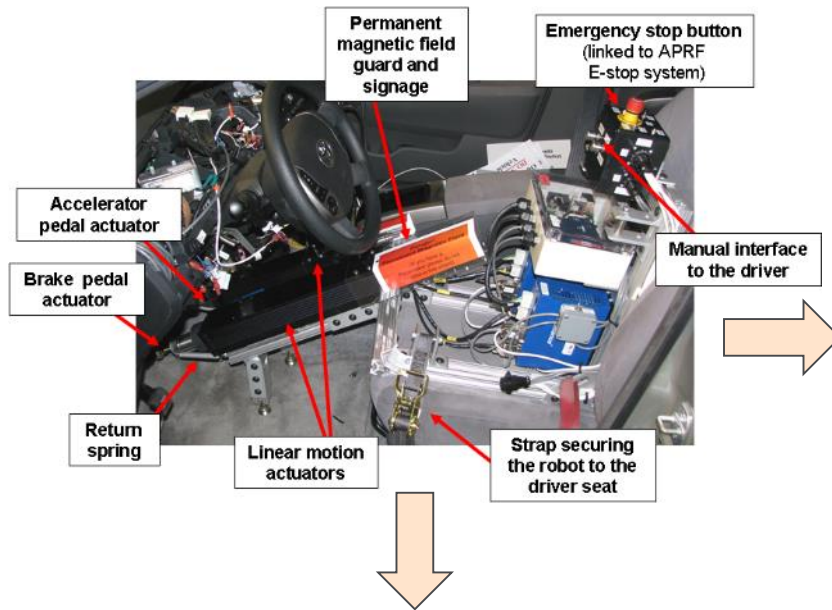
Dynamic Road Load (i.e. aero from platooning)



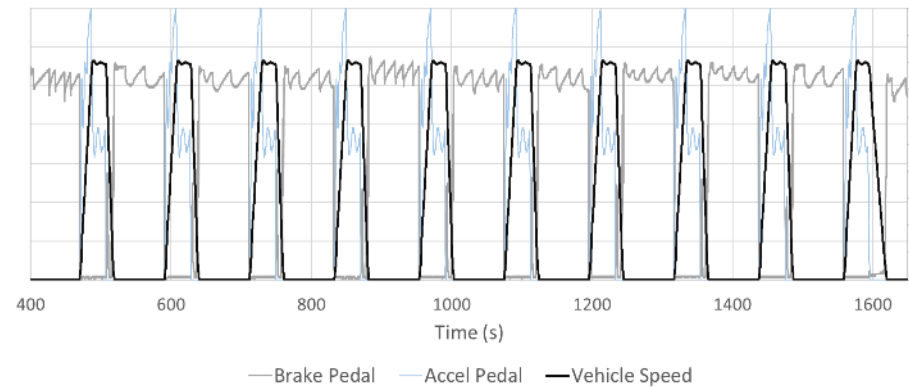
Flexible
“Perception” Layer

“Environmental”
Emulation

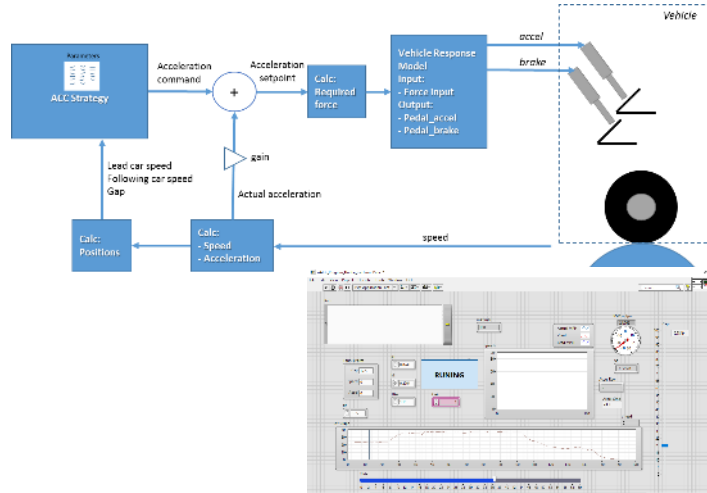
Accomplishments: Energy-Centric CAV Laboratory – Robot Driver Adaptations: Eco-Launch and ACC



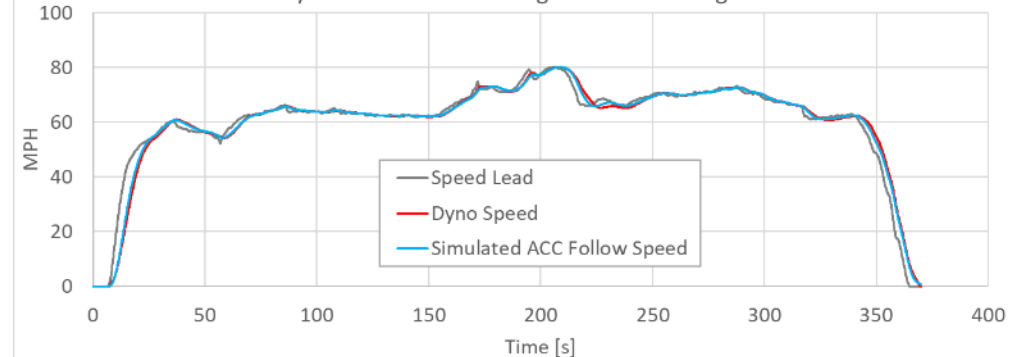
Repeatable Eco-Approach/Launch Trajectory



Vehicle's ACC was emulated with robotic controls (simulated lead vehicle and gap)

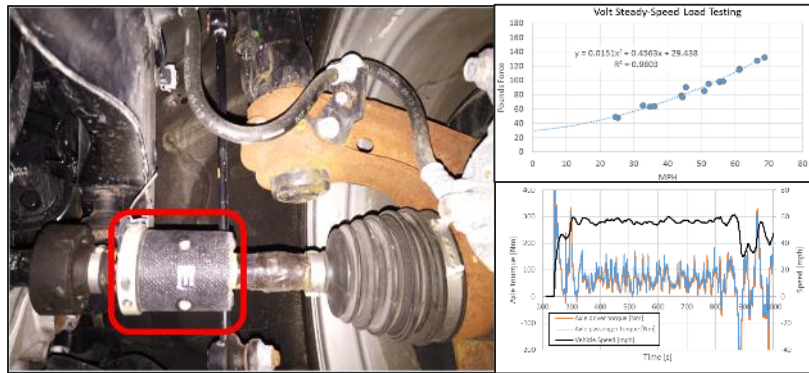


On-Dyno Test: ACC Following Lead Car driving US06

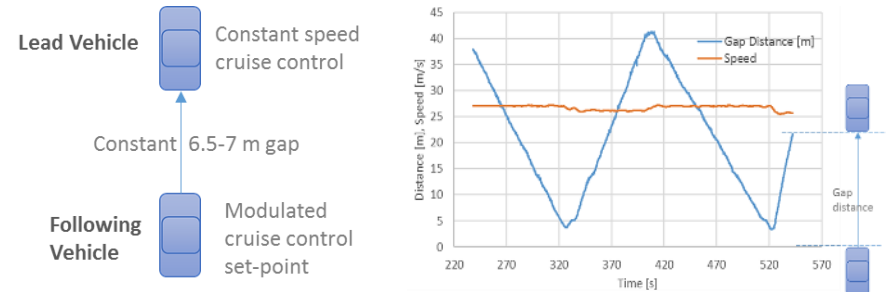


Accomplishments: Tractive Load Measurement during Vehicle Platooning - Proof of Concept

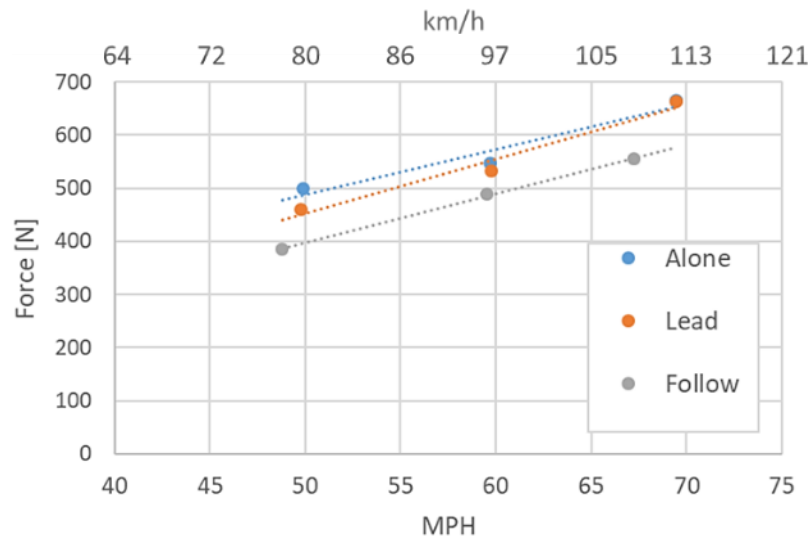
Axle torque sensors can directly measure road-load differences during following



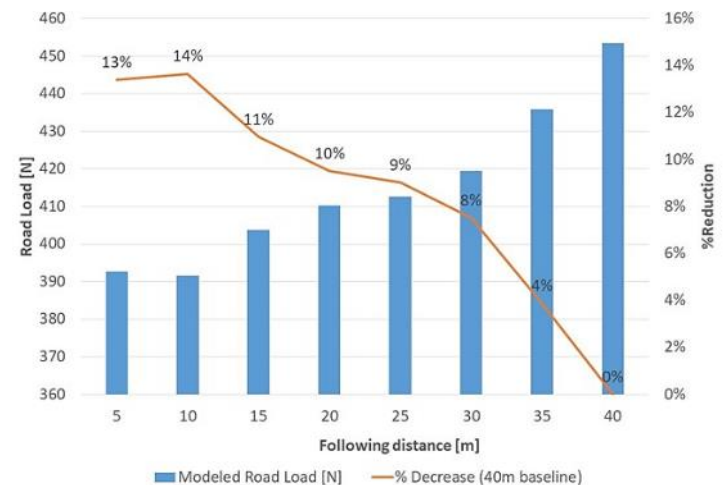
1) Fixed Distance 2) Dynamic Varying Distance



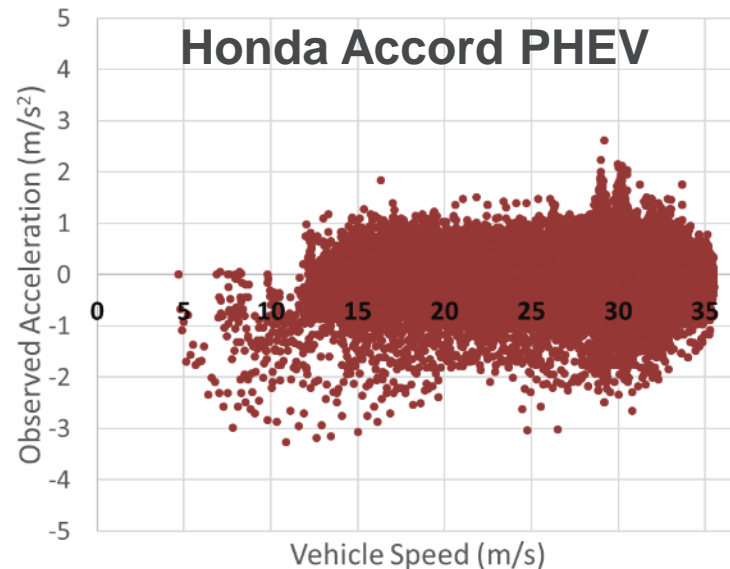
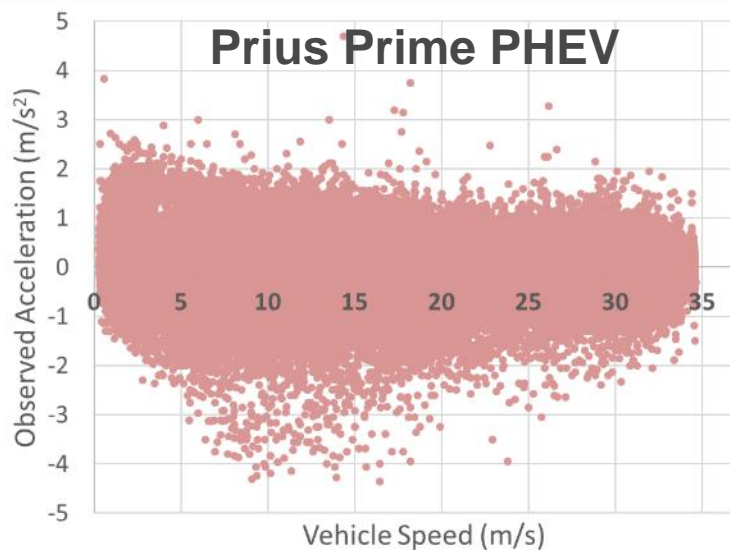
Fixed Distance Results (6.5-7m)



Preliminary Varying Distance Results



Accomplishments: Simplified ACC System Characterization from On-Road Data Collection

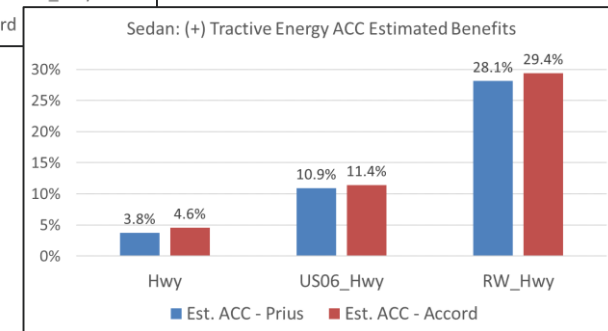
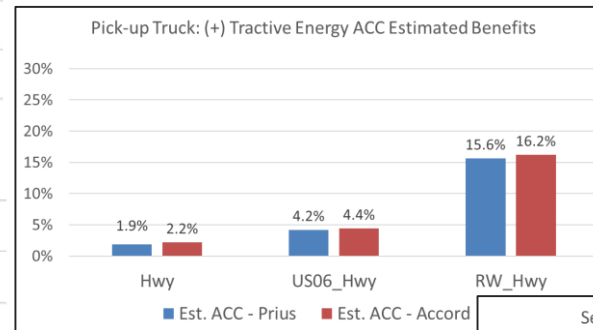


$$a_k = k_1(x_{k-1} - x_k - t_{hw}v_k) + k_2(v_{k-1} - v_k) \quad [1]$$



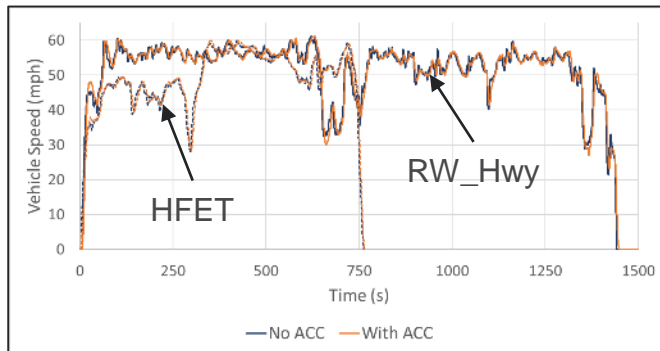
k1	0.0243	dist
k2	0.2704	speed
Ts	1.18	s

k1	0.0180	dist
k2	0.2405	speed
Ts	1.28	s

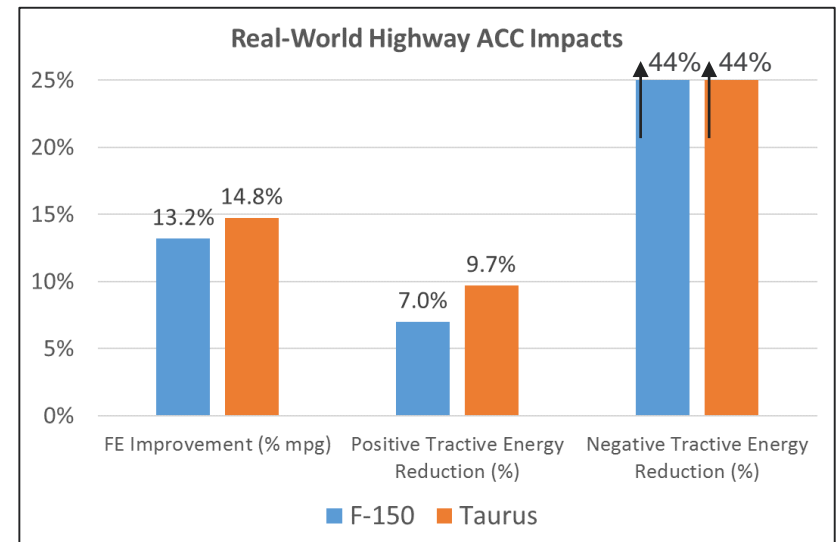
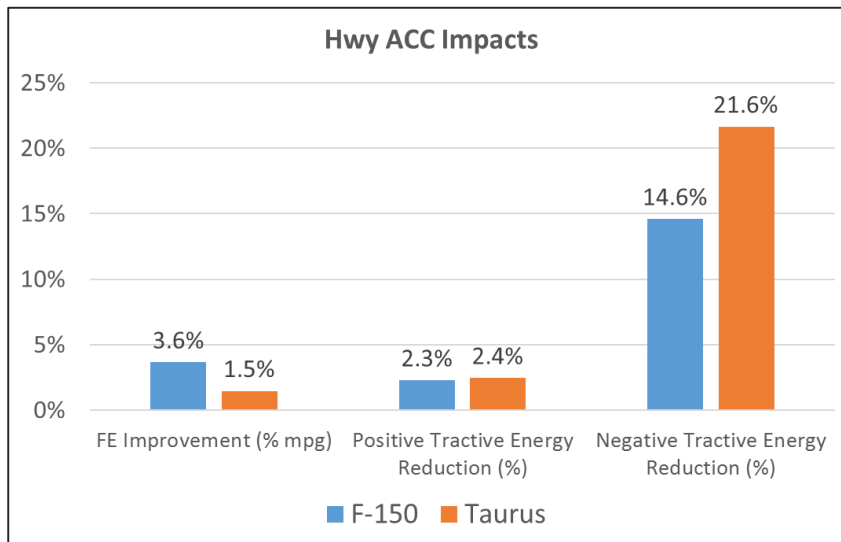


[1] Milanés, Vicente, and Steven E. Shladover. "Modeling cooperative and autonomous adaptive cruise control dynamic responses using experimental data." *Transportation Research Part C: Emerging Technologies* 48 (2014): 285-300.

Accomplishments: Highlighted Dynamometer Results - ACC Conventional Vehicle Impacts for “Highway” Driving

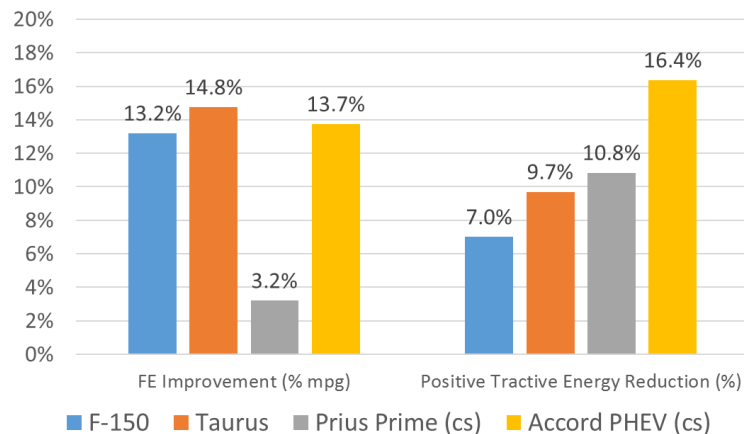


- Results vary significantly with cycle
- FE changes do not necessarily mirror tractive energy changes
- ACC cycles show fewer shifts (Taurus=62%, F-150=56% for RW-Hwy Cycle)
- ACC operation shows expanded top-gear utilization (26-29% for RW_Hwy)
- Aggregate engine usage similar, but fewer excursions with ACC



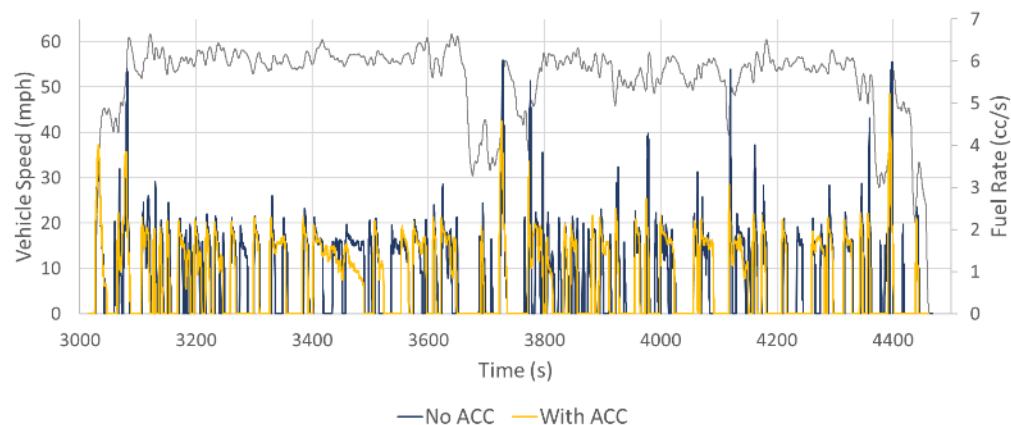
Accomplishments: Highlighted Dynamometer Results - Hybrid vs. Conventional Vehicle Impacts

Real-World Highway ACC Impacts



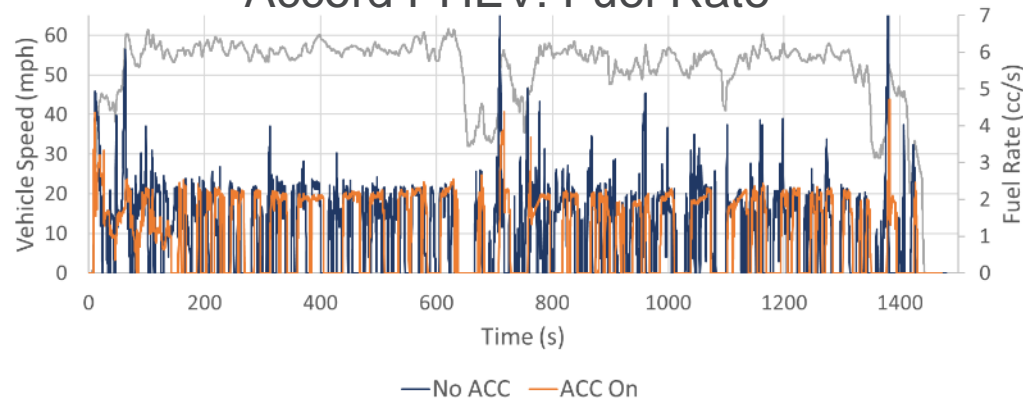
Differences in ACC benefit for selected HEVs is a mix of control and architecture

Prius Prime: Fuel Rate



- Both HEVs show a significant decrease in regen. braking energy (38% Prius, 49% Accord)
- Accord shows a significant increase in EV operation
- Prius shows slight increase in EV operation

Accord PHEV: Fuel Rate

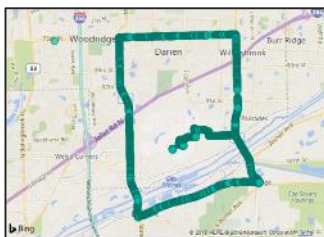


Accomplishments: Preliminary On-Road ACC Analysis and High Fidelity Data Collection (collection on-going)

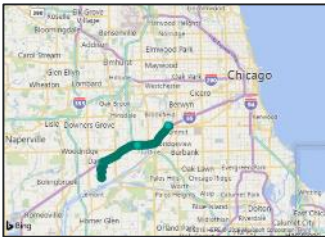
Arterial



Arterial Loop



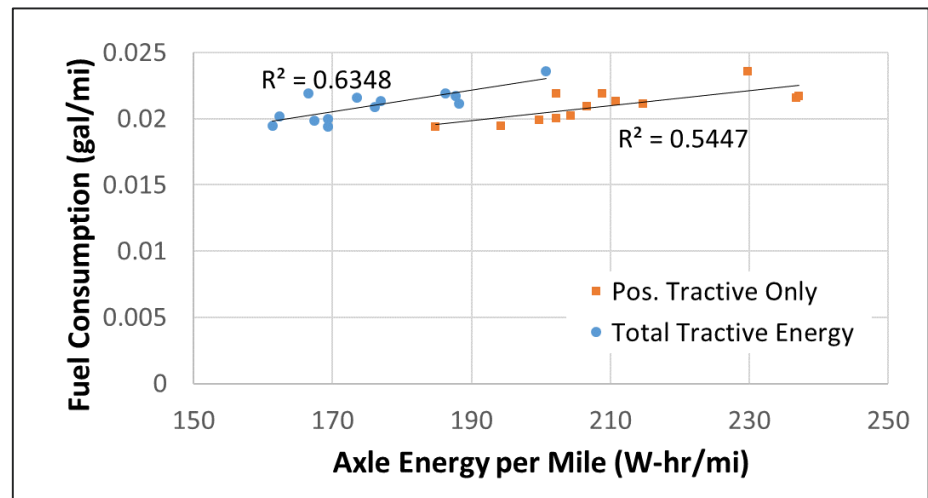
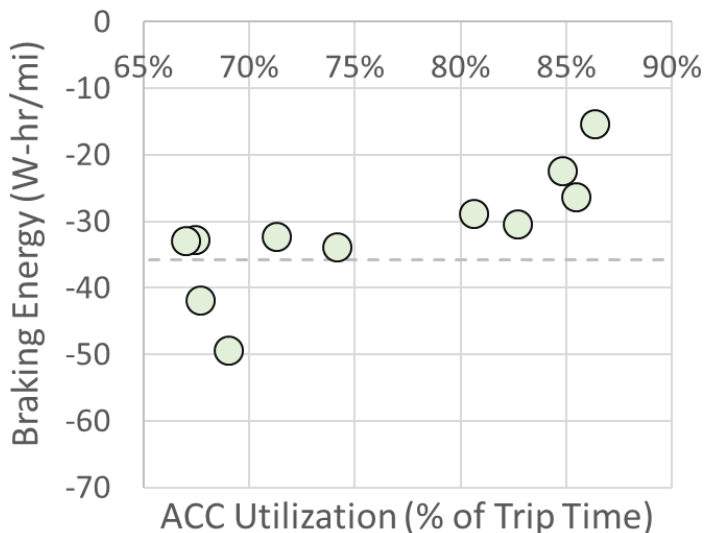
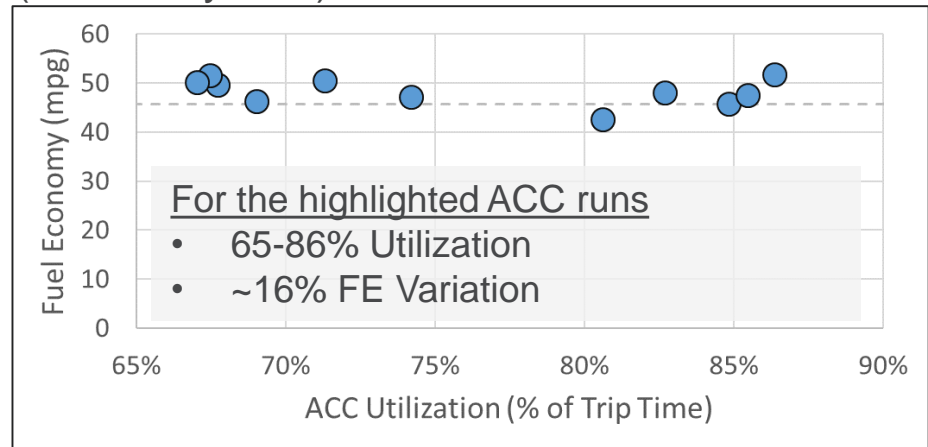
Short Interstate



Extended Interstate



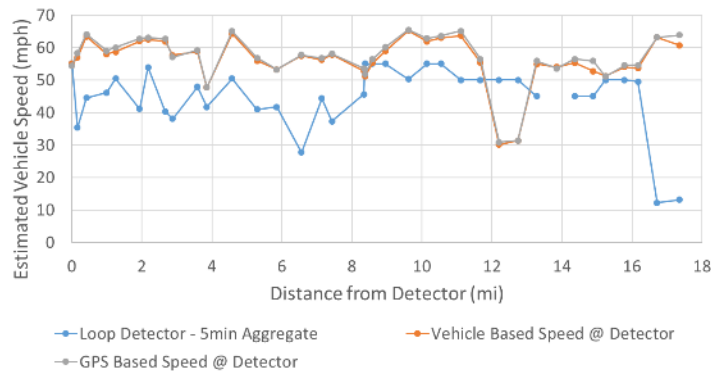
Highlighted EB Extended Interstate Trips (mix of day/time)



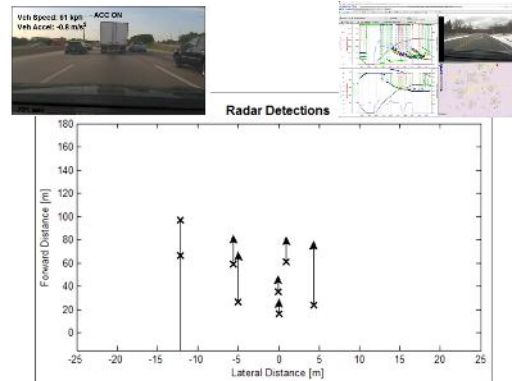
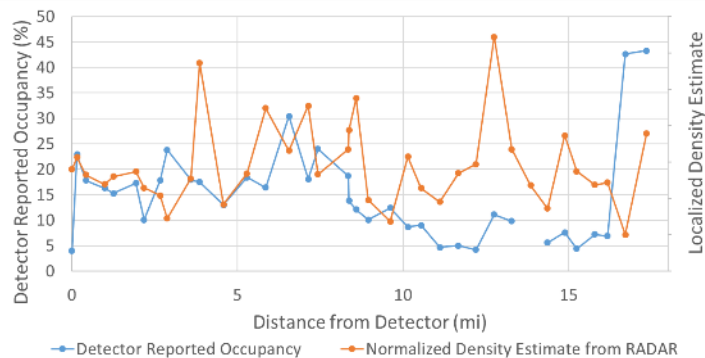
Accomplishments: CAVs Enabled Awareness Opportunities

- Using just a radar system combined with GPS, many interesting opportunities arise

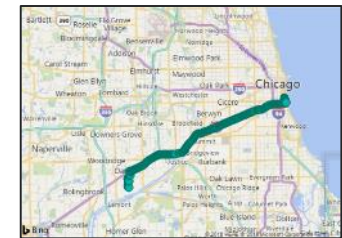
Supplemental Vehicle Speeds
(similar to GPS probe data)



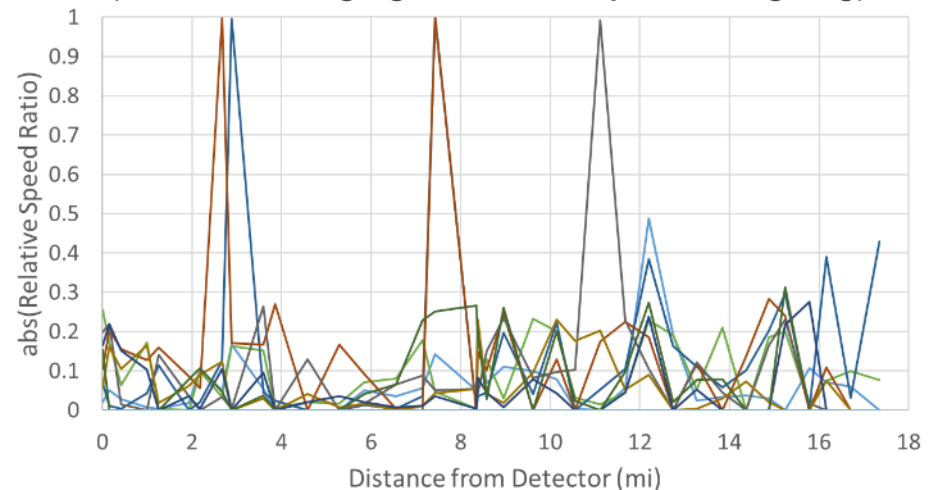
Can Vehicle Radar Estimate Density?
(data collection/analysis on-going)



Extended Interstate



Motionless Objects Easy to Detect with Radar
(fuse with imaging to detect object – on-going)



Partners / Collaborators

Argonne Vehicle and Mobility Modeling:

- Data & validation support for Autonomie, RoadRunner, SV-Trip, ...

DOE SMART - National Laboratory Partners:

- Primary Participants: ORNL, ANL, INL, LBNL, NREL
- Coordination with CAVs and other DOE SMART Mobility pillars where/when applicable: AFI, CAVs, MDS, US

University Partners:

- Illinois Institute of Technology

DOE HPC-BigData for Mobility Design and Planning

- ANL, LBNL, ORNL, PNNL
(not primary data set, but hopefully provide supporting data as needed)

Highlighted Future Research

Laboratory Testing

- Continued refinements/expansion of the emulation layers (perception and environment)
- Tighter integration within DOE M+S toolchain (Autonomie, RoadRunner, ...)
- Evaluation of higher-level automation/coordination strategies

On-Road Testing

- Expanded data collection scope (more vehicles, more locations, more technologies)

Targeted On-Road & Track Testing

- Multi-vehicle/mixed-type platoon road-load estimation
- CACC and related strategy impacts for HEVs and BEVs

CAVs Enabled Awareness and Sensing Opportunities

- Opportunities with L3-L4 sensors (i.e. LIDAR, multi camera/radar, etc.)
- Cyber-security implications of advanced sensing and connectivity within the larger EEMS operational environment

Summary

Relevance

- Disruption in transportation will transform how and what DOE instruments, tests, and evaluates to provide insights and support modeling efforts

Approach

- 4 core hardware focused research thrusts (with interactions across)
- Focus on high-fidelity data across all testing environments

Highlighted Accomplishments

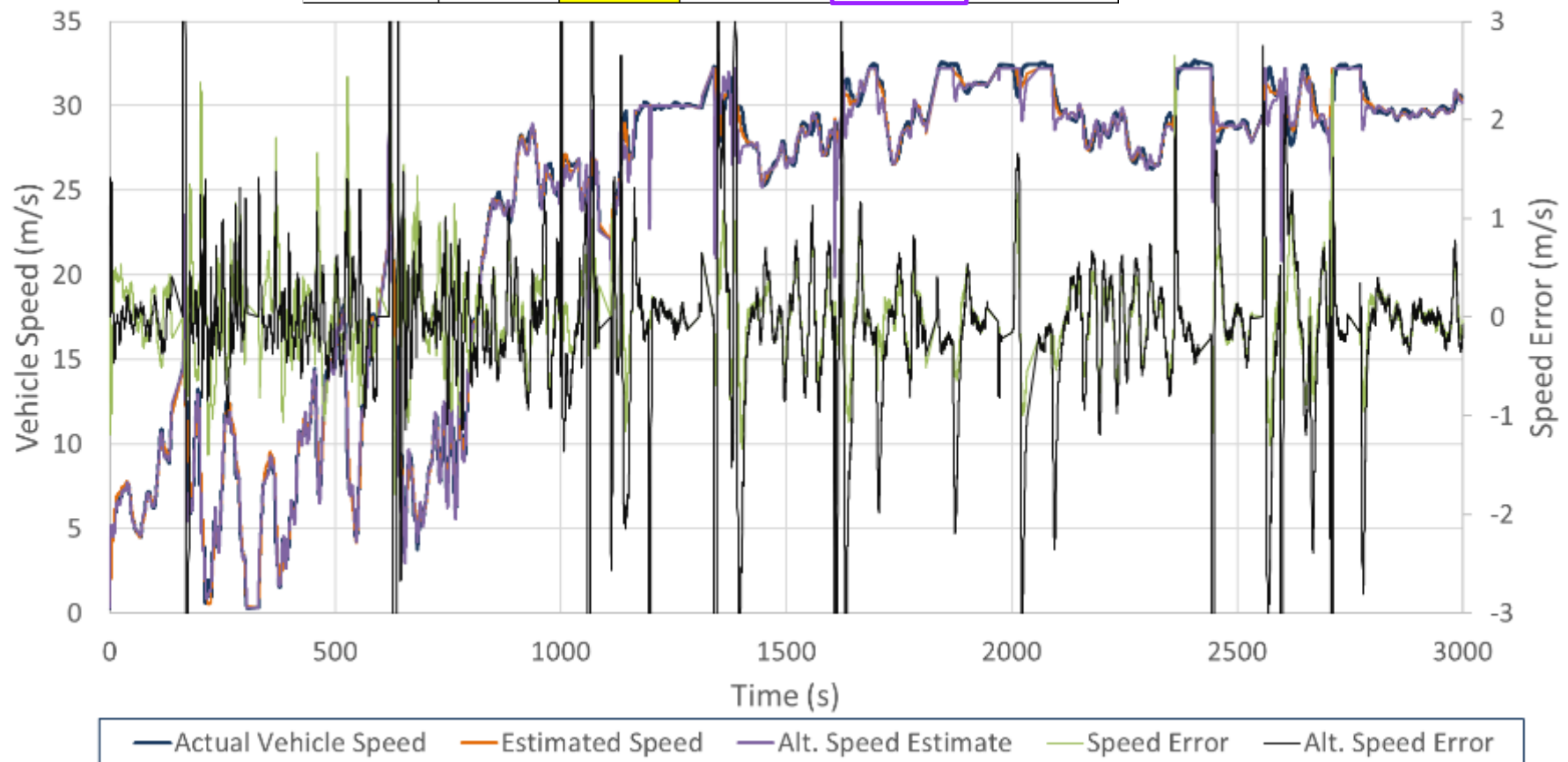
- Foundational layer of an energy-centric CAVs laboratory
 - Robot driver provides a flexible and portable interface for evaluation of CAVs driving behaviors
- Modifying existing instrumentation practices may provide critical CAVs data for modeling and validation
- Dynamometer testing of even basic CAV features highlights a range of interesting trends and opportunities for further analysis
- Connectivity combined with location-awareness and emerging vehicle sensing opens a wide range of new possibilities

Technical Back-up Slides

Methodology Considerations: On-Road Data to Fit Simplified ACC Behavior



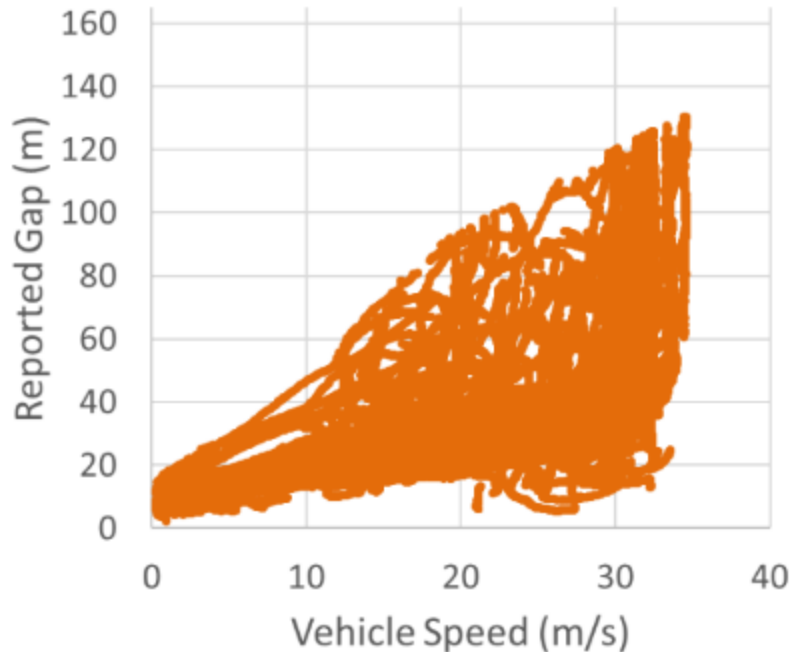
	MSE	SumABS	Ref.	Ref. + Opt.	MSE-CACC
k1	0.02	0.02	0.23	0.23	-
k2	0.28	0.27	0.07	0.07	-
Ts	1.25	1.18	1.1	1.78	-
AVE SqErr	0.450	0.459	2.460	2.155	0.450
Sum ABS Err	64246	63663	130724	119346	64241



Methodology Considerations: Simplified ACC Fit Driven by Data Collected

$$a_k = k_1(x_{k-1} - x_k - t_{hw}v_k) + k_2(v_{k-1} - v_k)$$

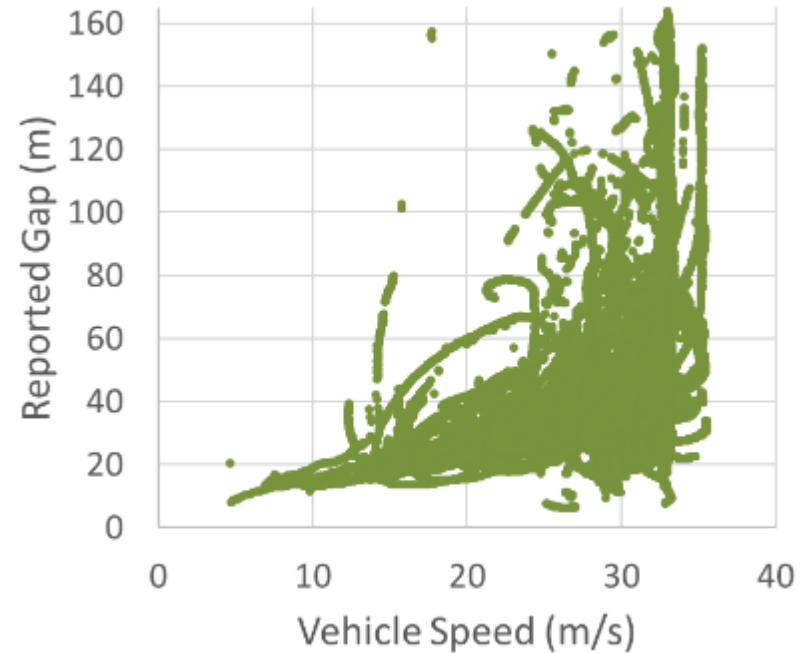
Prius Prime



Prius Prime (gap <40m)

	Opt U-40	Std All Data	OptU40 Time + Ref
k1	0.04	0.02	0.23
k2	0.31	0.27	0.07
Ts	1.17	1.18	1.50
Sum ABS Err (<40m gap)	37649	39193	68013

Accord PHEV



Accord PHEV (gap <40m)

	Opt U-40	Std All Data	OptU40 Time + Ref
k1	0.04	0.02	0.23
k2	0.30	0.24	0.07
Ts	1.19	1.28	1.19
Sum ABS Err (<40m gap)	18869	20883	30099

A more formalized methodology (or alternative testing methodology) would improve some of these common issues...